### Simulating the Large Synoptic Survey Telescope (LSST) One Photon at a Time

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& the LSST Collaboration & the LSST DESC Collaboration



# Modern Cosmology

- Most measurements have suggested a Universe of mostly dark energy, some dark matter, and little baryon filled Universe
- CMB ~ total content: few % within critical
- Clusters ~ DM/atoms ratio is ~6
- Supernovae~DE dominant in expansion
- BBN ~ small fraction of atoms



Is this even right? 96% of the Universe is beyond the Standard Model. What is the consequence of this? What can we measure about these further?

# Future Measurements in Cosmology

- Need more data to get higher statistical precision
- Need multiple astrophysical techniques

- However, when you push towards higher statistical precision have new systematics that need to be understood
- And with a large enough quantity of data & high enough precision would need both fast and high fidelity simulations to understand these details





#### 1) SNe to Measure Expansion Rate (Perlmutter 1998; Reiss 1998)

2) Time delays in strong lens images (Suyu 2010)



3) Cluster Mass Function Evolution (Vikhlinin 2009; JRP 2012)





4) Baryon Acoustic Oscillations in Matter Power Spectrum (Eisenstein 2005)

#### High Precision Cosmological Techniques

4000

#### 5) Weak Gravitational Lensing



#### High Precision Cosmological Techniques



Dark Energy Constraints

Will have increasing discriminatory power to distinguish between cosmological constant and various models

LSST will measure:

- ✤ 3 billion galaxies
- 10 billion stars
- ✤ 1 million SNe
- ✤ 10,000 clusters
- Dark Matter Map of Entire Sky

[Also the other major area requiring high precision is stellar astrometry where large Fraction of milky way will be mapped with proper motions & some parallaxes]

#### How does LSST do this? Etendue



Etendue is the product of Area and Field of View

To get more area simply build a large telescope

To get higher field of view, favor designs with shorter focal lengths, and minimal vignetting, reasonable off-axis image quality

Consequence of this is have to build a large camera

Consequence of a large camera is large data rate

# Large Synoptic Survey Telescope (LSST)

Adler Planetarium, Brookhaven National Laboratory (BNL), California Institute of Technology, Carnegie Mellon University, Chile, Cornell University, Drexel University, Fermi National Accelerator Laboratory, George Mason University, Google, Inc., Harvard-Smithsonian Center for Astrophysics, Institut de Physique Nucleaire et de Physique des Particules (IN2P3), Johns Hopkins University, Stanford University, Las Cumbres Observatory Global Telescope Network, Inc., Lawrence Livermore National Laboratory (LLNL), Los Alamos National Laboratory (LANL), National Optical Astronomy Observatory, Princeton University, Purdue University, Research Corporation for Science Advancement, Rutgers University, SLAC National Accelerator Laboratory, Space Telescope Science Institute, Texas A & M University, The Pennsylvania State University, University of Arizona, University of California at Davis, University of California at Irvine, University of Illinois at Urbana-Champaign, University of Michigan, University of Pennsylvania, University of Pittsburgh, University of Washington, Vanderbilt University



www.lsst.org



- Largest survey telescope: Highest Etendue (area\*FOV) for a telescope: 320 m<sup>2</sup>deg<sup>2</sup>
- Largest data rate 10Tb/night!
- ✤ 8.4 m mirror; 6 filters (300-1100 nm)
- Largest Astronomical Camera
- ✤ Joint NSF & DoE project
- ✤ Commissioning in ~2019;
- ✤ First science observations in ~2021
- ✤ Surveys the ½ the sky every few nights
- ✤ Get ~1000 images in 6 colors over 10 years to ~27 mag of everything (billions of galaxies & stars, & all asteroids >150 m, rare objects)

# LSST Site









# LSST Mirrors





# LSST Camera



# Importance of Simulations for LSST

- More data than any other astronomical project
- Produces 3 gigapixel images (~1500 HDTV's) every 15 seconds
- ✤ No one can ever look at all the data → Automatic processing (that has to work when telescope turns on)
- In addition, some of the most accurate measurements ever made have been planned especially for cosmology
- $\Rightarrow$  Maybe we should do some simulations
- Have led development of a novel photon simulation (phoSim) code for several years in the LSST project

#### **DESC Simulation & Analysis Framework**



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#### Universe → Catalogs → Photons → Images → Measurements

COSMO-LOGICAL SIMULATOR:

Synthetic Universe is constructed CATALOG CONSTRUCTOR (CATSIM): Universe is parameterized in catalogs that can later be photon sampled

#### PHOTON SIMULATOR (PHOSIM):

Atmosphere, Telescope, & Camera physics formulated in terms of photon manipulations DATA MANAGEMENT (DM) & DESC LEVEL-3 ANALYSIS:

Image processing to produce catalogs and measurements on the catalogs

Image Simulations (IMSIM)=PHOSIM+CATSIM

# Image Properties

•••

- First order image properties
  - Photometric zeropoint
  - Background level
  - PSF size
  - Astrometric scale

Some existing simulators (Sky Maker (Bertin), Shapelets (Dobke), GalFast (Mandelbaum), DES (Lin)) use parametric models to capture some image properties

To get detailed second image properties have to go to full photon Monte Carlo approach

Essentially all DE measurements depend on some combination of detailed PSF size/shape, astrometry, or photometry

		Second	Order	Image	properties
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- PSF size wavelength dependence
- PSF size spatial dependence
- PSF size spatial variation
- \* PSF shape (ellipticity and other moments)
- PSF wings
- \* PSF shape wavelength-dependence
- \* PSF shape spatial decorrelation
- PSF shape spatial variation
- Differential astrometric non-linearity
- \* Differential astrometric wavelength-dependence
- \* Differential astrometric decorrelation
- Photometric chromaticity
- Photometric variation in time
- \* Background spatial dependence
- Background spatial variation
- Background wavelength dependence
   And more...

#### **Optical Photon Monte Carlo Simulations**

### **Physics of PhoSim**

Sky:

Observing configuration from OpSim Photon Monte Carlo for Galaxies (elliptical Sersic bulge/disk), Stars, Asteroids (moves during & between exposures) Dust absorption at source & Milky Way Separate SEDs for every object Instance Catalogs to include other objects Background of blank sky, moon, twilight, inc. gradients

#### Atmosphere:

Multi-layer multi-scale frozen Kolmogorov screens Outer scale model Seasonal Wind model for LSST site Turbulence vs. height model for LSST site Atmospheric raytrace (refractive turbulence & optical depth) Atmospheric dispersion Atmospheric molecular opacity (wavelength, height, & time dependent) Multi-level grey cloud model Optics & Detector:

Reflection/Refraction in optics/detector Diffraction LSST Optics Design (filter-dependent) Focal plane layout Two-level Spider design Alt/Az Tracking Errors, Rotation Jitter, Spider rotation Dome Seeing Surface Perturbations & Alignment errors of mirrors/lenses/detectors Large Angle Scattering Angle-dependent filter curves Lens coatings **Mirror Reflectivity** Saturation & Blooming Detector A/R QE & Charge diffusion model Cosmic rays Read Noise, Dark Current, Gain, Pre-scans, Offsets for amplifiers Hot pixels/columns & dead pixels Non-uniform QE Maps CTE Biases/Darks/Flats Complete Optimization for saturation, background, photon removal, & non-sequential rays

### Very important physics

- PSF size, shape, & astrometry (where the photon lands)
  - Optical Design
  - Perturbations/Misalignments
  - Charge Diffusion
  - \* Turbulence
- Photometry (*how many photons*)
  - Geometric design
  - Rayleigh scattering
  - Filter multi-layer coatings
  - Photo-electric conversion

Regimes of Image Simulation

 $D >> r_0 \sim 10 \text{ cm}$ 

Aberrations+Diffusion  $>> \lambda(f/\#)$ 

 $D << r_0 \sim 10 \text{ cm}$ 

Modern Survey Telescopes

Elliptical or More Complex PSF (Geometric Optics)



 $D >> r_0 \sim 10 cm$ 

Aberrations+Diffusion <<λ(f/#)

 $D \ll r_0 \sim 10 \text{ cm}$ or adaptive optics



 $t_{exp} \ll D/v \sim .1s$ 

 $t_{exp} >> D/v \sim .1s$ 

### Monte Carlo Efficiency



Basically doing a Monte Carlo over the incident radiation field through Time-dependent & Wavelength-dependent Physics

Extremely fast way of doing this integral even if we have large numbers of photons



**Catalog** Constructor

Connolly, Krughoff, Gibson (UW)

A catalog of positions, motions (proper motions, orbits), and physical properties (types, SEDs, spatial model, etc.) of objects expected to be seen by LSST. It is a multi-billion row relational database, and a suite of Python tools.

Used to create "instance catalogs" what is in the sky at a given time and what are their spatial & spectral properties; Include operational data of environment and observation control (moon position, filter, exposure, etc.)







- ✤ Galaxies from ACDM N-Body Simulations: Galaxy positions and properties from Millennium N-body simulation catalogs with gas cooling, star formation, supernovae and AGN (Lucia et al. 2008); Up to 28 mag in r-band/23 million galaxies
  - Morphologies modeled with combination of Sérsic profiles ellipticals and bulge + disk (Lucia et al., Gonzalez et al.); Spectral Energy Distribution fit to colors of source using spectral models (Bruzual & Charlot)
- Milky Way model of 10 million detectable stars; Based on state-of-the-art Galactic structure models surveys (Juric et al. (2008), Ivezic et al. (2008), Bond et al. (2010), Sesar, Juric and Ivezic (2011), Lopez-Corredoira et al. (2005)); Includes a full three-dimensional Interstellar dust distribution model to redden SEDs of stars & galaxies (Amores & Lepine (2005), matched to Schlegel, Finkbeiner, Davis (1998) maps at infinity)
- 10.6 M object Solar System Model w/ orbits & obs. Properties: inclues Near Earth Objects, Main Belt Asteroids, Trojans, Trans-Neptunian Objects, Scattered Disk Objects, (PanSTARRS Model, PASP 123, 423 (2011), Bottke et al 2002, Morbidelli et al, Grav et al. 2011)

Variable stars and transient objects (e.g. SNe)



### Draw Photons

- Direction: Direction chosen by (ra, dec) and telescope pointing (ra,dec) & rotator angle
- Wavelength: Monte Carlo Sample SED files to choose wavelength in rest frame of source
- Time: Monte Carlo Sample time between start and stop of exposure
- \* **Position:** Start at the top of the atmosphere in pupil pattern

#### **Additional Astrophysics:**

- **Redshift**: photon has wavelength redshifted after drawing from rest frame
- Dust: Two dust models that destroy the photons according to reddening laws; Apply both in the rest frame for internal reddening & in our frame from Milky Way models
- \* **Lensing:** Extended source models can be distorted by measuring their position from the center of the source and distorting final position of photon according to  $\gamma_1$  and  $\gamma_2$



#### Atmosphere Turbulence Phase screens

Temperature fluctuation in the atmosphere cause index of refraction variations and result in "seeing"

Well-known that atmospheric turbulence has approximately Kolmogorov spectrum ( $k^{-11/3}$ ) up to outer scale  $L_0$  (von Karman)

These patterns are essentially frozen and drift with constant velocity in a series of layers (Taylor)



Photons accumulate Refractive kicks through Frozen drifted phase screens of turbulence; ➤Possibly lost due to opacity

Diffraction on scales below 2  $r_0$  treated by full diffraction calculation

Atmospheric Dispersion simulated

#### Atmosphere Structure

Wind model (direction & data) uses data based on seasonal monthly averages for LSST latitude and longitude

Model for turbulence intensity as a Function of height

Model for outer scale a function of height





Atmosphere Opacity





1) Cloud model
2) Molecular opacity

O<sub>3</sub>
O<sub>2</sub>
H<sub>2</sub>O

3) Rayleigh scattering
4) Aerosols
Have complex spatial & temporal variation Local optical depth calculated for each ray segment
Absorption is pressure-dependent and there

Absorption is pressure-dependent and therefore height dependent





Series of optical surfaces (2D) that divide the 3-D volume into different media (glass, silicon, air)

Ray intercepts are found by minimizing the distance between the end of the ray and the surface

Interactions can occur at interfaces (reflection, refraction, absorption)





Each filter configuration has every surface

defined by the asphere equation

Each surface specifies the media (silicon, glass, air) between the surface in the 3-D volume

Chips in detector plane specified by rectangular surfaces having a nominal center, pixel size, x & y sizes



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M2	Mirror	6788	6156.2	1710	900	-0.222	0	0	0	-1.274e-23	0	-9.68e- 31	0	0	Mirror	Vacuum
M3	Mirror	8344.5	-6390	2508	550	0.155	0	0	0	-4.5e-25	0	-8.15e- 33	0	0	Mirror	Vacuum
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L1E	Lens	5021	82.23	775	0	0	0	0	0	0	0	0	0	0	Lens A/R	Vacuum
L2	Lens	0	412.64202	551	0	0	0		0	0	0	0	0	0	Lens A/R	Glass
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FE	filter	5530	26.60	378	0	0	0		0	0	0	0	0	0	None	Vacuum
L3	lens	3169	42.40	361	0	-0.962	0		0	0	0	0	0	0	Lens A/R	<b>3</b> Glass
L3E	lens	-13360	60	361	0	0	0		0	0	0	0	0	0	Lens A/R	Vacuum



Perturbations, Misalignments, & Tracking Errors

Every optical surface & CCD has an ideal location

During a particular simulation all surfaces & CCDs can be misaligned by the 6 degrees of freedom; Each optical surface can also have a surface perturbations place on the surface that represent the deviation from the ideal shape

These represent the perturbations & misalignments induced by the thermal, vibrational, pressure, gravitational stresses while the telescope is operating with the full control system as well as fabrication errors

In general, the perturbations & misalignments tend to induce anisotropic PSFs that are highly correlated across the entire focal plane (because mostly in pupil plane)

Also have tracking model for perturbations during an exposure

$$\mathcal{O}x_{i} = f_{i}u_{\downarrow} + \frac{dx_{i}}{dT}\left(T - T_{0} + \mathcal{O}Tg_{T}\right) + \frac{dx_{i}}{dQ}\left(Q + \mathcal{O}Qg_{m}\right) + h_{i}g_{0} + A_{ij}\left(a_{j} + \mathcal{O}a_{j}g_{a}\right)$$

$$a_{j} = A_{ji}^{-1}P_{i} + A_{jl}^{-1}Z_{lk} \overset{\mathfrak{g}}{\underset{e}{\overset{\circ}{\downarrow}}} 1 + \frac{\partial_{k}}{\sqrt{N_{avg}}} g_{0} \overset{\ddot{\overset{\circ}{\downarrow}}}{\underset{\emptyset}{\overset{\circ}{\downarrow}}} Z_{ki}U$$





# Multilayer Coatings

Photons reflected or transmitted according to multilayer models which are angle and wavelength dependent



### **Photoelectron Conversion**

Photons can convert into electrons as they traverse the Silicon (temperature-dependent)





# **Other Effects**

- Spider diffraction
- Dome seeing
- ✤ Large angle scattering from mirror micro-roughness & Mie scattering
- Bleeding & Saturation
- ✤ Ghosts
- Cosmic Rays





#### **Background Model**



Two components: Air glow & scattered Moonlight

Moon has Mie scattering & Rayleigh scattering which leads to color-dependent spatial gradient

Airglow has spatial variation & temporal variation



Adams et al.



### Digitization

- Amplifier Segmentation
- ✤ CTE (one electron at a time)
- Pre/Over scans
- ADC using bias, gain, nonlinearity model with variation
- Bit error in ADC
- Dark current
- Read noise & variation
- Hot pixels
- Hot columns
- Dead Pixels
- PRNU





- Entire focal plane
- 3gigapixels
- 1000 CPU hours
- 1 trillion photons
- Done on grid computing

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Central 5 x 5 chips

~1 sq. degree



#### Central chip

15' x 15'









# 3 Color Image





**4 Major LSST Data Challenges** so far (4/09,6/10,9/10,5/11,4/12); Run on grid computing at Purdue (incl. OSG), UW, SLAC, and Google; Currently produce data at ~10% of real time; All analyzed by Data Management Pipelines

Everything

compared to

(not possible

with real data)

simulation truth

- 4 thousand visits
- ✤ 28 million amplifier images
- 44 billion astrophysical objects
- ✤ 4 quadrillion photons



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PSF size & shape





Estimated shear systematic floor

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#### Validation!



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Conclusions

- Have a multi-purpose high fidelity optical image simulator (PhoSim) with physics appropriate for optical survey telescopes
- Will enable a number of state-of-the art algorithms to be developed that necessary for high precision cosmological measurements in the LSST DESC
- LSST will enable dark energy properties to be measured in unprecented detail & will make dark matter map of the entire sky
- Also possible to use for other telescopes